### EVALUATION OF SAFETY AT RAILROAD-

### HIGHWAY GRADE CROSSINGS

G. A. Leonards, Director Tos

Joint Highway Research Project

September 24, 1965

From: H. L. Michael, Associate Director

Joint Highway Research Project

File No: 8-5-6

Project Nos C-36-59F

Mr. Thomas G. Schultz submits the attached Final Report "Evaluation of Safety at Railroad-Highway Grade Crossings" as fulfillment of his proposed research submitted by him and approved by the Board on March 6, 1964. Professor J. C. Oppenlander guided the research and preparation of the report.

The results given in the attached report can be used to determine the type of protection that a rail-highway crossing warrants. Mathematical models are also given which permit the prediction of the relative hazard at a crossing and those factors which were found to increase the hezard are noted.

The report is submitted for acceptance.

Respectfully submitted,

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## Final Report

# EVALUATION OF SAFETY AT RAILROAD-HIGHWAY GRADE CROSSINGS

bу

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File No: 8-5-6

Project No: C-36-59F

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Lafayette, Indiana
September 24, 1965

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The author also wishes to express his appreciation to the Automotive Safety Foundation and the Joint Highway Research Project whose financial assistance made his attendance at Purdue University possible.

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# TABLE OF CONTENTS (continued)

												Ps	age
APPEN	DIX	•	•			•	•	•	•	•	•	•	68
Α.	Protection Standards		•						•				68
$B_{ullet}$	Field Equipment and Sample Data Sheet .	•						•			•		74
C.	Accident Location Factor Analysis Data.	•	•		•		•	•					77
D.	Combined Location Factor Analysis Data.	•					•	•	•				86
E.	Typical Installations					•	•	•	•		•		93
F.	Field Observations	•	•	•	•	•	•	•	•	•	•	•	98
VITA.							•					• -	106

	1
	1.0

## LIST OF TABLES

Table		3	Pag	gθ
1.	Summery of Protection Coefficients	,		נו
2.	Index of Hazard Notation	,	. :	14
3.	Correlation of Accident Rate with the Factors_ 56 Variable Factor Analysis	•	•	¥2
4.	Correlation of Exposure with the Factors- 56 Variable Factor Analysis			43
5•	Correlation of Accident Occurrence with the Factors- 28 Variable Factor Analysis	•	• '	48
6.	Results of Multiple Linear Regression and Correlation Analysis-Combined Data Equation 2	•	•	52
7•	Results of Multiple Linear Regression and Correlation Analysis-Combined Data Equation 3	•	• .	54
8.	Means and Standard Deviations of the Study Variables	•	•	78
9.	Correlation of Accident-Rate with the other Variables	•	• '	79
10.	Correlation of Total Exposure with the other Variables	•	• '	80
11.	56 Variable Rotated-Factor Matrix	•	•	81
12.	Contributions of the 21 Principal Factors	•	•	<b>3</b> 3
13.	56 Variable Factor-Score Matrix	•	•	84
14.	Means and Standard Deviations of the Study Variables	•	•	87
15.	28 Variable Factor Analysis	•	•	88
16.	Contributions of the 10 Principal Factors	•	•	3 <b>9</b>
17.	Correlations of Accident Occurrence with the other Variables.	,	• '	90
18.	28 Variable Factor-Score Matrix			rc rc

*	

## LIST OF FIGURES

Figure		Page
1.	Oregon State Highway Department Nomograph	. 17
2.	Oregon State Highway Department Prediction Curve	. 18
3.	Flow Diagram	. 27
4.	Protection Nomograph	. 56
5.	Crossbuck Standard	. 69
6.	Flashers Standard	. 70
7.	Gates Standard	. 71
8.	Advance Warming Sign Standard	. 72
9.	Roadway Pavement Marking Standard	. 73
10.	Field Equipment	. 75
11.	Sample Data Sheet	. 76
12.	Typical Crossbuck Installation	. 94
13.	Typical Flasher Installation	. 95
14.	Typical Gate Installation	. 96
15.	Typical Advance Warming Sign Installation	. 97
16.	Results of Inadequate Maintenance	. 99
17.	Inadequate Sight Distance	.101
13.	Seasonal Variation in Sight Distance due to Crop Growth	.105

#### AESTRACT

Schultz, Thomas Gordon. Ph.D., Purdue University, August 1965.

Evaluation of Safety at Railroad-Highway Grade Crossings. Major

Professor: Joseph C. Oppenlander.

The purpose of this research investigation was to analyze the effects of environment, topography, geometry, and highway and rail traffic patterns with respect to rail-highway grade crossing accidents in rural areas.

The mathematical tools of factor analysis and regression analysis were used to develop models for predicting the relative hazard at a railroad grade crossing. These models are based on rail volume, highway
volume, and roadside distractions, such as houses, businesses and advertising signs. To evaluate the proposed mathematical relationships, it was
necessary to collect sufficient data on many variables deemed to have an
influence on safety. Therefore, 56 variables were measured at the 289
accident locations and 23 variables at the 241 non-accident locations.

Previous research efforts were concerned either with long period accident experience or with before-and-after studies of the various protection devices. In this research, locations which experienced accidents in a two-year period were compared to non-accident locations. The results of this study can be used to determine the type of protection which a crossing warrants.

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#### INTRODUCTION

The motor vehicle-train accident, though infrequent, is the most severe in terms of fatalities, personal injuries and property damage per accident of all types experienced on American highways. This type of accident, however, can be eliminated only by closing all crossings to highway traffic or by construction grade separations for all rail-highway crossings.

The delay and congestion resulting from the first alternative obviously would not be telerated by the motoring public. Based on an estimated cost of separation improvements in Ohio, it would cost \$5 billion to construct grade separations at the 10,800 grade crossings in the State of Indiana. (28)

Another alternative is to install modern flashing lights with short arm gates at all crossings. Such an undertaking is estimated to reduce the number of accidents by a considerable amount, but the cost would be in excess of \$150 million. (28) This figure is more realistic but still represents an enermous sum of money. Furthermore, the expenditure of this amount of money might well be more efficiently used for the prevention of other types of accidents.

During 1962 and 1963, 149 people were killed in motor vehicle-train accidents in Indiana. This figure accounts for 6.0 percent of the total highway fatalities but only 0.4 percent of the total number of accidents. (17) The severity of these accidents is of general concern to the public and is invariably well publicized.

The national trend for reil-highway grade crossing accidents is

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decreasing, but the reverse is true in Indiana. Based on data compiled by the Interstate Commerce Commission at the close of 1953, the numbers of grade crossing accidents and fatalities in Indiana were smong the highest in the nation. Indiana was exceeded only by the State of Arkansas in grade crossing accidents per million cars registered and grade crossing deaths per million cars registered. (28)

The present warrants as specified by the Indiana State Highway Commission for the protection of highway-rail grade crossings are as follows:

- a) "Two or more main line tracks should be protected by flashing lights and short arm gates;
- b) Where train speeds are 70 mph or greater on single line tracks, flashing lights and short arm gates should be used; and
- c) All other crossings are protected by flashing lights except
  these where there is good sight distance in all quadrants and
  where either the highway traffic is less than 500 vehicles per
  day (ADT), or rail traffic less than 6 trains per day (TPD).
  These latter crossings are protected by reflectorized crossbucks
  and advance warning signs." (26)

These general warrants do not result in priority ratings based on hazard.

The priority for improving crossing protection at rail-highway intersections is left to subjective judgment.

In a recent report by the Interstate Commerce Commission based on data submitted by the railroads, Henry Vinskey concluded that the major cause of rail-highway grade crossing accidents is the failure of motor-vehicle drivers to yield to trains. (20) The purpose of this research study was to investigate existing conditions which might have encouraged drivers not to take reasonable precautions. The study constitutes an analysis of highway-rail grade crossing accidents with respect to the

effects of environment, crossing geometry, highway and rail traffic patterns, existing protective devices, and other relevant elements and their relative importance as a basis for determining a more effective and economic means of establishing the necessary railroad crossing protection.

In this study, mathematical models were developed to predict the relative hazard of rail-highway grade crossings for various types of crossing conditions and protection. Priority ratings based on this model or the significant hazards determined in its development would permit a wiser determination of the most needed improvements for rail-highway grade crossings.

Because of the large number of crossings and the high costs involved, it is not economically possible to eliminate all crossings or even provide all crossings with the most effective types of protection. The development of a method for establishing priorities among grade crossing projects is necessary because the amount of total expenditure is dependent upon the tax burden which the public is willing to assume.

Known accident locations and non-accident locations in rural areas were analysed to develop correlations for the study variables. Factor analysis and regression analysis were the analytical techniques employed. The principal concern of factor analysis is to resolve a set of variables linearly into a smaller number of factors. As a result, factor analysis often permits a simple interpretation of a given array of data and may afford a simplified description of the particular set of variables analysed. (29) Regression analysis provides a quantitative description of a dependent variable as it is functionally related to the independent variables.

Proper use of the mathematical models developed in this study permit:

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- 1. An estimation of hazard at a rail-highway grade crossing, and
- 2. A basis for establishing a priority program for improving protection.

In this study, theoretical methods were applied to practical conditions. The results are based on a scientific analysis and not on subjective judgment, and a better understanding of rail-highway grade crossing accidents has been gained through the appraisal and the evaluation of the many variables.

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### REVIEW OF LITERATURE

In <u>1878</u>, there were 191 railroad grade crossing accidents and 98 accompanying deaths reported for a seven-year period in the State of Massachusetts. During <u>1890</u>, 402 persons were killed and 675 were injured in the United States as a result of vehicle-train accidents. (9) These dates indicate that railway grade crossing accidents were a problem even before the advent of the motor vehicle. Authors, engineers, public officials, and railroad men have concerned themselves with safe railroad operation since 1830 when the Baltimore and Ohio operated the first common-carrier service. (14)

### Type of Protection

The introduction of the automobile on American roads and highways during the early 1900's resulted in even more accidents and emphasized the need for improved crossing protection. Many types of protective devices were installed and evaluated. Among these were crossbucks, bells, wig-wags, lights, rotating disks, flashing lights, watchmen, and gates. (12) Even a cable barrier was tested in Chicago, Illinois, in 1921. (9)

Only three devices are substantially used today for rural crossings. The crossbuck is the only protection given to drivers at 80 percent of the 225,000 grade crossings located in the United States. The next most common protective device is a flasher consisting of a flashing light with a bell. Automatic gates which lower and block vehicular traffic a minimum of 20 seconds prior to the arrival of the fastest train affords the most positive separation of highway and railroad traffic for at-grade locations.

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The ultimate in protection is, of course, the grade separation. An average cost of each necessary structure is presently estimated at \$350,000. (28)

The crossbuck only indicates the presence of a railroad crossing.

The flasher and automatic gates warn the motorists that a train is approaching. The effectiveness of the bell has been questioned, but undoubtedly some motorists are attracted by the noise when visibility of the flashing light is limited by reflected or direct sunlight. (32)

Realizing that the crossbuck is the basic warning device used at most crossings, T. M. Vanderstemple investigated the influence of various types of paint and reflective materials on the desirable properties listed below:

- 1. Reflection of light back to the approaching vehicle,
- 2. Ease of cleaning,
- 3. Reflective properties when wet,
- 4. Cost, and
- 5. Service life.

Vanderstemple concluded that reflectorized materials were far superior to any painted surface.

Stop signs and traffic signals have been incorporated at some crossings. The stop sign directs all vehicles to stop before proceeding, and the traffic signal can be automatically operated in conjunction with the approach of a train. In recent testimony before the Interstate Commerce Commission, G. H. Wyatt disclosed the results of experimentation with such protective devices in Michigan. Justification for such installations was based on the concept that such signs as caution, yield right-of-way, slow, and railroad crossing cause no immediate reaction, but the traffic signal and the stop sign do produce positive driver responses.

Fear of arrest was considered the primary reason for this behavior.

Comparative figures indicated a 6 to 1 ratio of accident reduction in favor of the traffic signal when compared to similar crossings protected by flashers.

Stop signs have been placed at grade rail-crossings on some secondary roads. To determine the merits of claims that people do not stop for such signs and thus become contemptuous of all stop signs, Wyatt (41) reported that observations of several installations disclosed that 93 percent of all drivers either stopped or slowed to speeds of less than 5 mph. He also noted that another recent study confirmed these results and that in one study of stop signs on low volume roads, accidents were reduced by 80 to 90 percent while in another study, the reduction amounted to 72 percent. Several other authors advocate the use of stop signs to protect the highway traffic approaching at-grade railroad crossings. (2, 5, 23, 28)

## Protection Coefficients

Protection coefficients are comparative numerical ratings of the measure of protection afforded by the various protection devices. The results of the several studies which have developed protection coefficients are summarized below.

1. L. E. Peabody and T. P. Dimmick, in a 1941 study performed by the Division of Transport, Public Roads Administration, collected data on 3,563 crossings in 29 states for a five-year study period. The protection coefficients calculated for the various types of crossings were based on the following emperical formula relating the protection coefficients to exposure units and accident experience: (31)

 $P = \frac{1}{N} \sum \frac{H \times T}{100A} = \frac{1}{100N} \sum \frac{H \times T}{A}$ 

where P = the protection coefficient for a type of protection,

N = the number of crossings in a type group,

H = the daily highway traffic volume at each crossing,

T = daily train traffic volume at each crossing, and

A = number of accidents.

The results of this analysis for P were:

Crossbucks 19

Flashers 114

Gates 333

2. Harold Marks summarized the results of three studies. The first study was based on a 20-year before-and-after analysis of 49 crossings where the protection was changed to gates. Data were taken from the files of the Public Utilities Commission and represented crossings in Los Angeles County. Because of the metropolitan character of Los Angeles County, these crossings were primarily located in urbanized areas. The change in protection from crossbucks to gates resulted in a 91 percent reduction in fatalities and 85 percent in personal injuries.

The second study reported by Marks was an Illinois study of 23 gate locations on the Grand Trunk Western Railroad.

Fatalities were reduced 93 percent and injuries 98 percent from those at the crossings with crossbucks.

A third study of 35 crossings on the Main Line, San Francisco to San Jose, disclosed that the installation of gates reduced accidents from those with crossbucks by 80 percent, fatalities by 94 percent, and injuries by 95 percent.

Using the reduction in fatalities as a comparative base,



the resulting protection coefficients were: (24)

	Los Angeles County	<u> Illinois</u>	State of California
Crossbucks	1	1	1
Flashers	3.5		
Gates	11	14	5

- 3. T. M. Chubb reported the results of a study in which crossbuck protection was changed to flasher protection in the City of Los Angeles. Approximately 400 crossing-years experience showed a reduction in accidents of 76 percent and fatalities more than 85 percent. Based on the reduction in fatalities, flashers resulted in 6.7 times fewer deaths than did the crossbucks. (4)
- 4. W. J. Hedley investigated 321 crossings in the State of Indiana for a 20-year period, 1920-1940. Based on a reduction in accidents after a change in crossing protection, the following protection coefficients were developed. (16)

Crossbucks 0.504
Flashers 0.177
Gates 0.092

5. C. McEachern in a four-year study of 190 accident locations in Houston, Texas, developed the following coefficients based on accidents per exposure: (25)

Crossbucks 0.015
Flashers 0.005
Gates 0.002

6. The Oregon State Highway Department concluded a five-year study of 378 accident crossings in 1950. Protection coefficients were calculated using the relationship between rail and highway

<u> </u>

volumes and the accident experiences of the various protection devices. The results of this study were as follows: (30)

Crossbucks 1.0

Flashers 0.6

Gates 0.1

These coefficients represent the results of before-and-after or accident experience studied at railroad grade crossings. They are summarized in Table 1 after setting the value for crossbucks at unity, with higher values indicating increased safety.

### Influencing Variables

One motor vehicle and one train arriving at a grade crossing at or about the same time are required for an accident. Therefore, the two most obvious variables which affect the potential for an accident are vehicle and train volumes. The type or degree of protection may also be important. Early research and hazard formulas were based on these three variables.

The Peabody and Dimmick study, for example, investigated traffic volumes, sight distances, vertical and horizontal alinement, surface types, and number of tracks. Only train and highway volumes and the type of protection were significantly related to the number of accidents. This study analysed 1,254 crossings of which more than 60 percent were in urban locations. (5)

F. B. Crandall of the Oregon State Highway Department found that nighttime accidents were 40 percent more likely to occur than daytime accidents. (30) In consideration of this fact, nighttime traffic volumes were increased by 40 percent in applying the developed hazard formula. The formula also considered the past accident experience of the crossing under investigation.

In a detailed analysis, the Armour Research Foundation reported that

TABLE 1

SUMMARY OF PROTECTION COEFFICIENT

State of Oregon 1.0 1.7 10.0 McEachern 1.0 7.5 2.9 Hedley 1.0 2.9 5.4 Los Angeles City 1.0 6.7 1 State of California 1.0 Study 5.0 State of Hillinois 1.0 1 14.0 Peabody Los Angeles Dimmick County 1.0 3.5 11.0 1.0 6.7 17.5 Type of Protection Crossbuck Flasher Gate

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the following variables were significant at the one percent level of significance: (7)

- 1. Number of tracks,
- 2. Type of highway surface,
- 3. Gradient of highway,
- 4. Visibility,
- 5. Vehicular speed,
- 6. Vehicular volume,
- 7. Rail speed,
- 8. Rail volume, and
- 9. Type of protection.

The horizontal alinements of the highway and the railroad had no significant influence on the safety of grade crossings.

Chubb points out that such variables as illumination, distractive influences, and visibility may also influence hazard at a crossing. However, these variables are extremely difficult to measure quantitatively. (9)

## Hazard Indices

Many indices of hazard have been developed as a result of the studies previously mentioned. A hazard index is a relative measure of hazard at a crossing as expressed by the influencing variables included in the equation. The formulas presented below have been reduced to common notation which is defined in Table 2. The first eight formulas were summarized by Marks. (24)

IH = A + I + 2K

Illinois Commerce Commission (Warren Henry):

$$IH = VR(1 + Q + A_{+} + U)$$

3. City of Detroit (adapted to California conditions):

IH = 
$$\left[\frac{V}{1000}\left(\frac{P}{10} + \frac{T}{20} + \frac{S}{30}\right) Q + N + C\right] G + A$$

4. Federal Aid Highway Deficiency Study:

$$IH = VR/1000$$

5. Los Angeles Grade Crossing Committee:

IH = 
$$\frac{V}{1000}$$
 [P + 10(T + S)]

6. California Public Utilities Commission Composite:

IH = 
$$\left(\frac{V}{1000}\right)$$
 (2R<sub>1</sub> + R<sub>2</sub>) (M<sub>1</sub>) (A) (G)

7. State of Oregon (1941):

$$IH = VR(U_S + R_S)(I + A)$$

8. California Department of Public Works and Public Utilities
Commission:

9. Utah-Idaho State Highway Department: (26)

$$IH = VR (T_1 + S + A_n + N + M)$$

10. State of Oregon: (30)

11. Arkansas State Highway Department: (26)

$$IH = VR(A + G)$$

12. Iowa State Highway Department: (22)

IH = 
$$\frac{.0167 \text{ VRs}}{2\text{S}}$$
 + 1.5306  $\left(\frac{\text{T}_{R}}{5}\right)$  +  $\frac{90}{\text{A}_{n}}$  +  $\frac{\text{S}_{s}}{100}$ 

<i>4</i> -	

Table 2
Index of Hazard Notation

IH = index of hazard A = accidents or accident factor  $A_n$  = intersection angle factor At = attention or distraction factor C = road condition factor D = darkness factor G = existing crossing protection factor I = number of persons injured K = number of persons killed M = special condition  $M_1$  = number of main line tracks N = total number of tracks or rating factor P = number of passenger trains traversing the crossing in a 24-hour period = quadrant visibility factor R = number of trains traversing the crossing in a 24-hour period R<sub>1</sub> = number of trains per day exceeding 25 mph  $R_2$  = number of trains per day traveling at 25 mph or less R<sub>s</sub> = train speed factor S = view factor  $S_w = number of switching movements traversing the$ crossing in a 24-hour period  $S_s = stopping sight distance$ T = number of through freights traversing the crossing in a 24-hour period  $T_R$  = terrain factor = train type and speed factor U = user factor V = number of vehicles traversing the crossing in a 24-hour period or rating factor

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#### Warrants

Warrants represent various criteria for the justification of improved crossing protection. W. A. McLaughlin, with replies from all but six of the 48 states, determined that 17 states use numerical warrants for grade-crossing protection. (26)

For federal-aid highways the United States Bureau of Public Roads requires all grade crossings with: a) multiple main line railroad tracks; b) multiple track crossings with or without main tracks on which more than one train may occupy the crossing at a time; c) single or multiple track crossings where the train operating speeds are 70 mph or greater and sight distances are restricted; to be protected with flashing light signals with short arm gates.

A general numerical warrant recommended by the Bureau and used by seven states is as follows:

- 1. Flashing lights are to be installed on new construction and existing grades when the cross product of ADT and TPD (15 years hence) is between 1,500 and 5,000.
- 2. Short arm gates and flashing lights are to be installed on new construction and at existing grades where the highway traffic exceeds 2,000 ADT (15 years hence) or where product of TPD and ADT (15 years hence) is greater than 5,000 for single line tracks or exceeds 3,000 for double line tracks.

Arkansas uses its hazard rating formula and has established numerical warrants. California, Idaho, and Utah also have established numerical warrants based on their individual formulas.

Illinois considers signalization when the cross product of ADT and TPD is 3,000. They also base their warrant on an economic criteria. Indiana's general warrants are discussed in the Introduction. Michigan



uses subjective judgment except that no crossing will be signalized that has less than 400 ADT or four or less TPD. Nine states use the Peabody and Dimmick nomograph shown in Figure 1. (31)

## Prediction Formulas

The prediction of accident frequency is useful both in the determination of crossing warrants and for the economic justification of crossing protection.

The prediction equation proposed by Peabody and Dimmick is as follows: (31)

$$I = \frac{H^a \times T^b}{Pc} + K = 1.28 \frac{H^{0.170} \times T^{0.151}}{P^{0.171}} + K$$

where I = probable number of accidents in a 10-year period,

a,b,c, = exponential constants,

H = ADT, motor vehicles,

T = number of trains per day,

P = protection coefficient, and

K = an additional parameter to account for variability
 (approximately 33 percent of the estimate).

The engineers of the Oregon State Highway Department predict accidents for a 5-year period by using the graph shown in Figure 2. (30)

The regression analysis performed by the Armour Research Institute resulted in the following formula: (7)

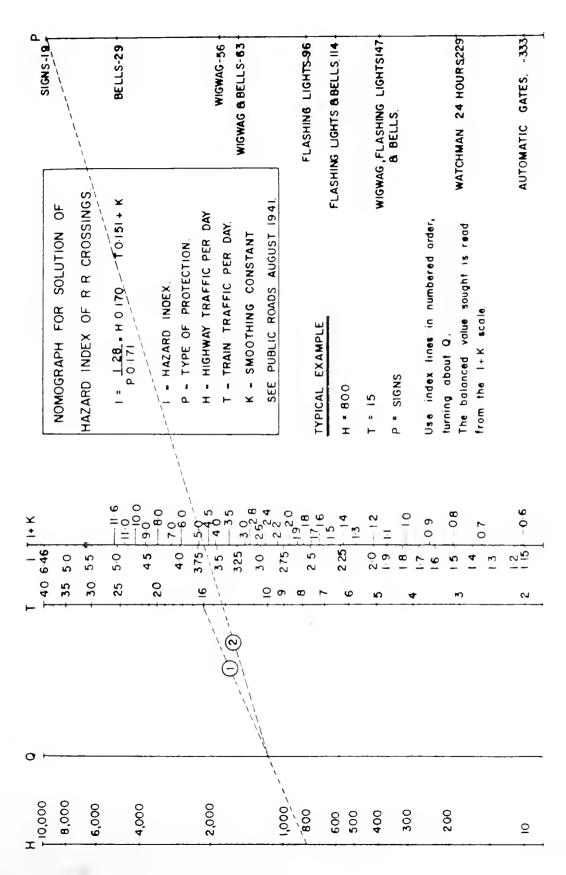
$$Y = 0.701 X_{01} + 0.830X_{02} + 0.975X_{03} + 0.549X_{04} - 0.042X_{1}$$
$$- 0.974X_{2} - 0.065X_{3} + 0.047X_{1}^{2} + 0.023X_{2}^{2} - 0.013X_{3}^{2}$$
$$+ 0.084X_{1}X_{2} - 0.023X_{1}X_{3} + 0.200X_{2}X_{3}$$

where Y = expected number of accidents for a 16-year period,

$$X_{01} = 1$$
,  $X_{02} = X_{03} = X_{04} = 0$  for painted crossbucks,

 $X_{02} = 1$ ,  $X_{01} = X_{03} = X_{04} = 0$  for reflectorized crossbucks,

*	



OREGON STATE HIGHWAY DEPARTMENT NOMOGRAPH (SOURCE: PUBLIC ROADS VOL. 22, NO 6. ACCIDENT HAZARDS AT GRADE CROSSINGS.) F16. 1

#### ACCIDENT PREDICTION CURVE

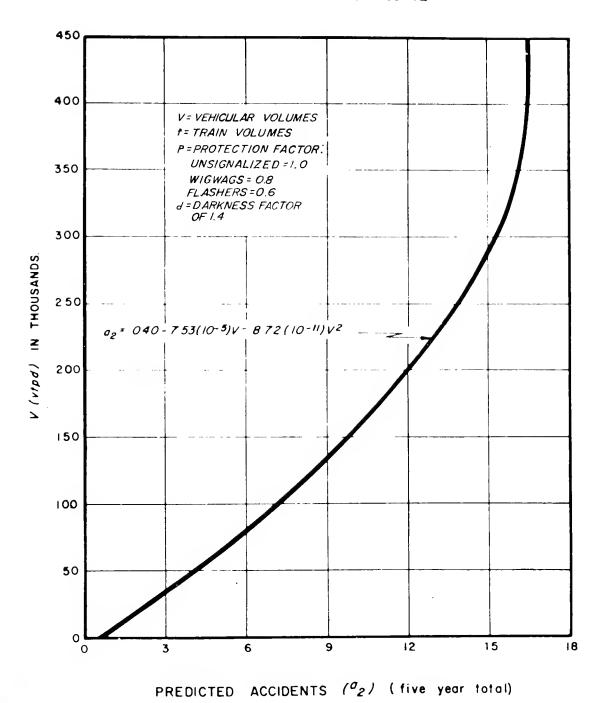


FIG. 2 OREGON STATE ACCIDENT PREDICTION CURVE (SOURCE: OREGON STATE HIGHWAY DEPT., TECHNICAL REPORT NO. 56-3, GRADE CROSSINGS ON STATE AND FEDERAL AID HIGHWAYS.")

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 $X_{03} = 1$ ,  $X_{01} = X_{02} = X_{04} = 0$  for automatic flashers,  $X_{04} = 1$ ,  $X_{01} = X_{02} = X_{03} = 0$  for automatic gates,  $X_{1} = \text{rated visibility of each quadrant, 0 for good,}$ 0.25 for fair, and 0.50 for poor,

X = highway volume evaluated as follows:

 $X_3$  = number of tracks (maximum of four).

## Protection Standards

The crossing protection devices investigated in this study have been standardized and receive the combined approval of the Association of American Railroads and the Bureau of Public Roads. (3, 6, 36) These standards are described in Appendix A.

The American Association of State Highway Officials has established the following design criteria: (2)

- National uniformity of warrant criteria exists in the agreement that the degree of grade crossing protection should be based upon the daily exposure factor.
- Protective devices should be clearly visible at a distance at least equal to the stopping distance required.
- Roadway gradient should be flat at and adjacent to the railroad crossing.
- 4. The corner sight triangle should be maintained clear of obstructions.

- 5. In other than flat terrain, it may be necessary to rely on speed control signs and warning devices.
- 6. Sight distance along the railroad tracks should be 13.5 times the train speed for a single-unit highway vehicle and 17.5 times the train speed for a 50-foot combination highway vehicle.

## Factor Analysis

Factor analysis is an analytical tool which permits a parsimonious description of a given set of variables by resolving the variables linearly into a smaller number of factors. J. Versace in his article discussing factor analysis as a tool for accident analysis wrote:

"There is no one cause of accidents. Instead, there are innumerable influences acting at any instant, and for all we know there may even be a residual component of causelessness. The fact that there is a great number of influences should direct us to explore techniques that will seek to find groupings of these influences that have something in common. This common element then would take on a significance of its own and allow us to consider a smaller number of more comprehensive ideas instead of individual influences." (38)

Factor analysis has been used as an analytical tool in the field of traffic engineering in two recent speed studies. Reliable prediction equations were developed by the factors generated from the multitude of variables investigated. Factor analysis also is used to obtain additional understanding of the relationships that exist among a great many variables. (29, 40)

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#### PROCEDURE

An initial decision in this study was to decide the nature of the crossings to be analysed. Several previous studies considered only crossings which had accidents with the result that coefficients of the resulting formulas were based primarily on the variability in the number of accidents. Such a study requires accident data over a long period of time because it is extremely rare when more than one accident occurs at a particular crossing in a period of one or two years.

Because accident data were readily available for only two years, 1962 and 1963, and so that more meaningful correlations could be developed, accident locations were compared to non-accident locations. The 289 accident locations, which included most of the rural crossings in Indiana with at least one accident in 1962 and 1963, were established by using the traffic accident reports of the Indiana State Police. The 241 non-accident locations were randomly selected in the following manner:

- 1. The railroad lines were outlined on a state map;
- 2. Railroad mileage for each county was measured on the map;
- 3. By simple proportion based on reilroad mileage, each county was allocated a number of the total non-accident locations to be investigated; and
- 4. The selected number of railroad crossings in each county was selected from county maps.

To ascertain that each non-accident crossing represented an accident-free location, the nearest available residents to the crossing were asked about accidents at the proposed study location. If an accident



had occurred at the location, the crossing was eliminated from the analysis. The railroads also checked their records for accidents at these non-accident locations. The contact with residents was also valuable in another way. They often supplied needed information regarding the installation dates of new protective devices.

Many possible variables were selected and all those which could be realistically evaluated were investigated. Many variables were evaluated subjectively by use of dichotomous values (0 or 1 value representing absence or existence of a situation).

The information for the 56 selected variables came primarily from three separate sources: police accident reports; field investigations; and railroad correspondence. These variables and the equipment used for their measurement are given in the following description of the variables. Appendix B contains a photograph of the equipment along with a sample field data sheet. In the following lists the variable name is followed by the method of coding or the units of measurement.

## Description of the Variables

From Accident Report Data (Accident Locations Only)

- 1. Vehicle type (Coded 0 if car, 1 if truck).
- 2. Age of vehicle years.
- 3. Out-of-county vehicles (Coded 0 if in-county, 1 if out-of-county).
  The vehicle registration or owner's address was used to determine the origin of the vehicle.
- 4. Out-of-state vehicle (Coded O if in-state, 1 if out-of-state).
- 5. Number of occupants driver plus passengers. This variable was included because of the possible distraction caused by passengers.
- 6. Actual car speed mph. The speed of the car was not always listed on the accident report. The car speed was then

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- established by driving the approach to the crossing at the speed the investigator considered a maximum safe speed for the highway and subtracting 10 mph.
- 7. Actual train speed mph.
- 8. Vehicle defects (Coded 0 if no defects, 1 if defects were indicated). This variable indicated the officer's opinion of whether or not mechanical defects were a contributing factor to the accident.
- 9-11. Surface type portland cement concrete, asphalt, or gravel

  (Coded 0 if absent, 1 if present for each type). These three

  variables were also applicable to the non-accident locations and
  the data for them were obtained from field observations.
- 12. Dry pavement (Coded 0 if dry, 1 if wet or had ice or snow).
- 13. Ice or snow (Coded 0 if dry, 1 if ice or snow).
- 14. Clear weather (Coded 0 if clear, 1 if cloudy).
- 15. Darkness (Coded 0 if daylight, 1 if darkness). This variable was defined as darkness if the accident occurred between 6:00 p.m. and 6:00 a.m.
- 16. Window position (Coded 0 if window down, 1 if window rolled up).

  Often the officers reported the windows were up (and/or radio playing), and driver possibly could not hear either the warning bells or train whistle. If the accident report did not indicate this information, the time of day, time of year, and reported weather conditions were used as guides.
- 17. Drinking driver (Coded 0 if not drinking, 1 if drinking).
- 18. Male-female driver (Coded 0 if female, 1 if male).
- 19. Driver age years.

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- 20. Personal injury (Coded 0 if no personal injury, 1 if personal injury). The number of personal injuries involved in an accident was not recorded because of the obvious strong relationship to number of passengers. A fatality was considered a personal injury for this variable.
- 21. Fatality (Coded 0 if no fatality, 1 if fatality). The number of deaths was not recorded because of the relationship to number of passengers.
- 22-28. Day of the week (Coded 0 if not on a certain day, 1 if on the day).

#### Field Data (All Locations)

The data obtained at a grade crossing were measured on the approaches where an accident occurred at accident locations and on one randomly selected approach each for vehicles and trains at non-accident locations. Variables 29 to 35 were coded as 0 if not existing. 1 if existing.

- 29. Painted crossbuck.
- 30. Reflectorized crossbuck.
- 31. Flasher.
- 32. Gate.
- 33. No protection. (No gate, flasher, or crossbuck.)
- 34. Stop sign.
- 35. White edge line.
- 36. Highway gradient percent. This variable was measured with a hand-level and Chicago self-supporting rod, recorded by sign to the nearest 0.1 percent.
- 37. Railroad gradient coded same as variable number 36.
- 38. Highway curvature degree. This variable was measured by taking the offset in inches at the center of a 62-foot chord attached to

- nails driven in the center of the highway.
- 39. Railway curvature degree, measured same as variable number 38 (chord attached to rails with a magnet).
- 40. Number of tracks pairs.
- 41. Pavement width feet.
- 42. Advance warning sign (Coded 0 if not existing, 1 if existing).
- 43. Pavement crossing markings (Coded 0 if not existing, 1 if existing).
- 44. Number of businesses. This variable represents the number of business establishments located a distance of one-half mile along the approach to the crossing on both sides of the roadway.
- 45. Number of advertising signs measured similarly to variable number 44.
- 46. Presence of minor obstructions (Coded 0 if not obstructed, 1 if partially obstructed). This variable considered such things as brush or trees which would hinder the view of an approaching train but would not completely block its view.
- 47. Number of houses measured similarly to variable number 44.
- 48. Line of sight coded by sine of angle. This variable represents the angle at which a motorist could first view an approaching train when the vehicle is at a distance from the crossing equal to the stopping sight distance as determined either by the speed limit or maximum safe speed of the highway. The sine of the angle included between the highway and the first view of an approaching train was recorded to three decimal places. A hand compass was used to measure this angle.
- 49. Intersection angle degree. This variable was measured with a hand compass and coded to the nearest five degrees.



# Railroad Correspondence Data (All Locations)

- 50. Average number of passenger trains per day.
- 51. Average number of freight trains per day.
- 52. Average freight train speed mph.
- 53. Average passenger train speed mph.
- 54. Total number of trains TPD.

### Vehicular Traffic Data (All Locations)

- 55. Average daily traffic ADT. The files of the Indiana State
  Highway Commission were used as a reference for collection of
  these data.
- 56. Average car speed mph. Determined as described in discussion of variable number 6.

#### Analysis of the Data

All data were punched on IBM cards for the various statistical analyses. The schematic diagram shown in Figure 3 outlines the analytical approach used in this research investigation.

Two factor analyses were performed to develop descriptive explanations of the grade crossing characteristics. Orthogonal principal factors were generated in decreasing order of their contribution to the total variance. Factor analysis reduces a multi-variable correlation matrix to a common factor matrix. Because a factor is a measure of several variables, the resulting factor matrix has fewer dimensions. Since the factors are orthogonal, they are independent of one another. To facilitate the interpretation of the generated factors, the coordinate system is rotated until the variance for each factor is maximized.

After the factor analyses were performed, the dependent variables representing accidents were functionally related to the factors by means of multiple regression techniques. The regression coefficients were

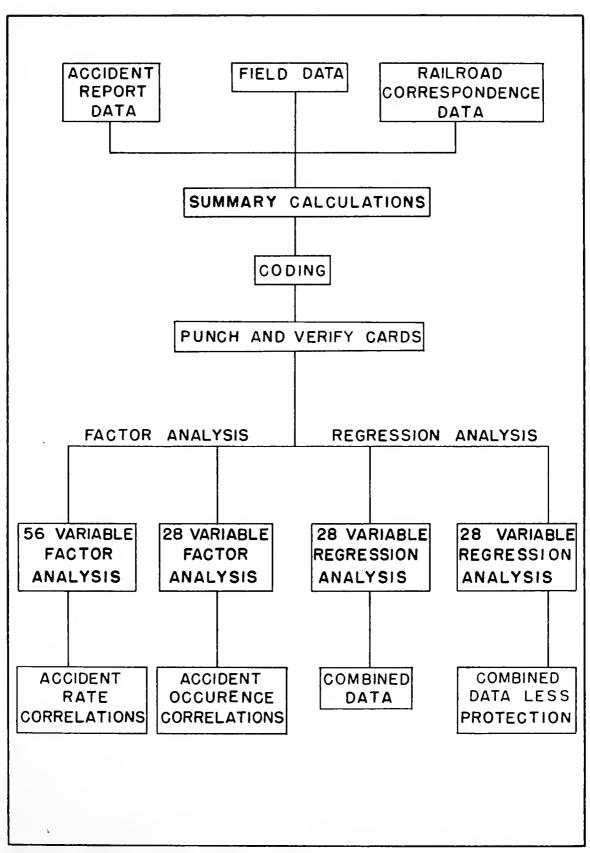


FIGURE 3 - FLOW DIAGRAM

developed by solving the following equations expressed in matrix notation. The first equation was used to develop the factor scores to permit evaluation of factors for values of the variables while the second equation correlated the dependent variable with the factors.

 $E = A F'y^{-2}P$ 

where E = factor-score matrix.

A = varimax matrix.

P = principal-factor matrix, and

y = diagonal matrix of latent roots.

c = Er'

where c = column vector of regression coefficients,

E = factor-score matrix, and

r = row vector of correlation coefficients for the

dependent variable correlated with the independent

variables.

The dependent variables for the factor analysis performed on the accident locations only were accident rate as determined by the inverse of the ADT and total exposure represented by the inverse of the product of train volume and vehicular volume. For the combined data factor analysis, the dependent variable was accident occurrence, a dichotomous variable representing occurrence or non-occurrence of an accident (coded 0 if non-accident location, 1 if an accident location).

Regression analysis was performed on 28 variables common to both accident and non-accident locations. Three other common variables - rail-way gradient, stop sign, and no protection - were not included due to insufficient data. The "buildup" regression routine allowed the ordering of variables which thus eliminated confusing interpretation. In general, ADT and TPD were ordered so that their contributions to hazard were

considered initially.

## Mathematical Models

The linear regression model for factor analysis utilizes the regression coefficients between the dependent variable and the various factors.

IH = 
$$\overline{H}$$
 + s( $e_1F_1$  +  $e_2F_2$  +...+  $e_mF_m$  +  $e_U$ )

where IH = index of hazard.

 $\overline{H}$  = grand mean of the hazard.

s = standard deviation of hazard,

c; = common factor coefficient,

$$(j = 1, 2, ..., m),$$

$$F_{j} = \sum_{i=1}^{n} e_{i,j} Z_{i} = K_{j} = \text{common factor}$$
  
 $\{i = 1, 2, ..., n; j = 1, 2, ..., m\},$ 

 $e_{ij}$  = standard regression coefficient for j-th factor score

$$(i = 1, 2, ..., n; j = 1, 2, ..., m),$$

 $Z_i = independent variable (i = 1, 2, ..., n),$ 

 $K_{i}$  = residual variable for j-th factor score

$$(j = 1, 2, ..., m),$$

c = unique factor coefficient,

U = unique factor,

m = number of common factors, and

n = number of independent variables.

The linear regression model for regression analysis is as follows:

IH = 
$$a + b_1x_1 + b_2x_2 + ... + b_nx_n + Q$$

where IH = index of hazard,

a = intercept,

 $b_i$  = regression coefficient (i = 1, 2, ..., n),

 $x_i = independent variable (i = 1, 2, ..., n),$ 

Q = residual variable, and

n = number of independent variables.



The index of hazard referred to in the factor analysis is the functional relationship between the independent variables and the generated factors. The index of hazard for the regression analysis is the functional relationship between the dependent and independent variables.

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#### RESULTS

Solutions to the proposed mathematical models for estimating apparent hazard at a railroad grade crossing are presented and discussed according to the statistical techniques employed. A factor analysis was performed on the 56 variables which described the 289 accident locations. The resulting factors were then correlated with dependent variables representing accident hazard. Another factor analysis was performed on the 28 variables that were descriptive of both accident and non-accident locations. These factors were then correlated with accident occurrence as the dependent variable. Several regression analyses were also performed to express hazard in terms of the influencing independent variables.

Means and standard deviations of the study variables are presented in Tables 7 and 11 in Appendices C and D, respectively. Factors are denoted with letters, and variables numerically, to facilitate referencing throughout the text.

### Summary Statistics

Twenty-five of the 56 variables investigated in this study pertained only to the accident locations. The remaining 31 variables described both accident and non-accident locations. The following statistical summary was developed from the at-grade highway-railway crossings analysed in this research investigation.

- 1. Driver characteristics.
  - a. Driver age The average age of all drivers involved in a grade crossing accident was 36 years.
  - b. Driver sex 86 percent of these drivers were male.

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- c. Driver residence 72 percent of the drivers were from the county in which the accident occurred. Ninety-four percent of the drivers were residents of the State of Indiana.
- d. Number of occupants The average number of occupants was1.36 persons per vehicle.
- e. Drinking driver Only six percent of the accident reports indicated that the driver had been drinking.
- f. Personal injury 62 percent of the accidents resulted in at least one personal injury.
- g. Fatality 14 percent of the accidents resulted in at least one fatality.

#### 2. Vehicle characteristics.

- a. Vehicle type 27 percent of the accident vehicles were trucks.
- b. Age of vehicle The average age of vehicles involved in grade crossing accidents was 5.2 years.
- c. Vehicle defects 17 percent of the vehicles evidenced contributing mechanical defects.
- d. Window position 71 percent of the vehicles were considered to have had their windows rolled up at the time of the accident.
- e. Actual car speed The average of the reported car speeds of vehicles involved in accidents was 24 mph.
- f. Actual train speed The average of the reported speeds of trains involved in accidents was 41 mph.

### 3. Environmental characteristics.

a. Clear weather - 74 percent of the accidents occurred during clear weather.



- b. Darkness 36 percent of the accidents occurred at night.
- c. Pavement surface moisture Pavements were dry 57 percent, wet 16 percent, and had ice or snow 27 percent of the time that accidents occurred.
- d. Day of the week Accident occurrence by day of the week is summarized below:

Monday	14.2%
Tuesday	14.5%
Wednesday	11.8%
Thursday	15.6%
Friday	16.3%
Saturday	15.6%
Sunday	11.8%

The following data were collected at both accident and non-accident locations. They represent the geometric and traffic characteristics that were employed in the development of the prediction equations presented in this study.

			Accident Locations	Non-Accident Locations
4.	Roa	dway characteristics		•
	a.	Horizontal curvature	0.23 Deg.	0.14 Deg.
	b.	Vertical alinement	1.0%	1.0%
	c.	Pavement width	19.7 ft.	17.2 ft.
	d.	Pavement type:		
		Portland Cement Concrete	7%	1%
		Asphalt	75%	43%
		Gravel	18%	56%
	Θ.	Intersection angle	94 Deg.	90 Deg.



# Accident Location Factor Analysis

In an attempt to determine the underlying causes of highway-railroad grade crossing accidents, the 56 variables previously identified and discussed were factor analysed. Twenty-one significant factors with a latent root of 1.0 or greater were generated. The correlation matrix was factorized by the principal-axis technique with ones inserted in the main diagonal of the matrix. The value of 1.0 for the terminal latent root was arbitrarily established for the selection of the significant factors. The contribution of these factors to an explanation of the total variance of the variables is shown in Table 12, Appendix C, to be approximately 70 percent. This factor matrix affords a parsimonious description of the 56-dimensional space representing the original variables.

The orthogonal factors were rotated by the varimax technique to facilitate physical interpretation of the common factors. The principal-exis solution was thus transformed into the more understandable form represented by the rotated-factor matrix in Table 11, Appendix C.

In general, only variables with factor coefficients of ±.300 or greater were used to interpret the factors. Variables with smaller loading values were occasionally considered because they complemented the identification. An interpretive name, description and the important contributing variables with their respective factor coefficients are listed below.

- A. Major railroad facility. This factor describes the conditions characteristic of an important railroad operation.
  - 40 Number of tracks. +.608
  - 51 Number of passenger trains, +.665
  - 52 Number of freight trains, +.797
  - 53 Average train speed, +.301
  - 54 Total number of trains, +.847



- I. Inadequate alinement. The restrictive vertical and horizontal alinements with associated low vehicular speeds identifies this catagory of crossing environment.
  - 6 Actual car speed, -.399
  - 9 Portland cement concrete, -.314
  - 36 Highway gradient, +.665
  - 37 Railway gradient, +.354
  - 38 Highway curvature, +.406
  - 39 Railway curvature, +.236
  - 48 Sine of angle of view, +.522
  - 56 Average car speed, -. 346
- J. Female driver. Women who have consumed alcoholic beverages are normally not found driving vehicles on the highway.
  - 17 Alcohol, -.648
  - 13 Male driver, -.598
  - 33 No protective device, -.736
- K. Truck traffic. All of these variables combined represent typical truck travel.
  - 1 Truck, +.448
  - 2 Vehicle age, +.369
  - 5 Number of occupants, -.773
  - 18 Male driver, +.238
  - 38 Highway curvature, -.344
- L. An interpretative name could not be assigned for this factor.
  - 27 Saturday, -.300
  - 28 Sunday, +.802

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- M. High-speed railroad location. All variables suggest high-speed train operations.
  - 7 Actual train speed, +.699
  - 39 Railway curvature, -.312
  - 50 Average freight train speed, +.869
  - 51 Number of passenger trains, +.454
  - 53 Average train speed, +.864
  - 54 Total number of trains, +.300
- N. An interpretive name could not be assigned for this factor.
  - 1 Trucks, -. 327
  - 26 Friday, +.815
  - 27 Saturday, +.362
- O. An interpretive name could not be assigned for this factor.
  - 22 Monday, +.763
  - 27 Saturday, -.425
  - 38 Highway curvature, -.333
- P. An interpretive name could not be assigned for this factor.
  - 25 Thursday, +.832
  - 27 Saturday, -. 404
- Q. An interpretive name could not be assigned for this factor.
  - 23 Tuesday, -.843
  - 27 Saturday, +.353
  - 39 Railway curvature, -.378
- R. Local traffic. These variables suggest travel in the area of the driver's residence.
  - 1 Trucks, -.333
  - 3 Out-of-county, -.730
  - 4 Out-of-state, -.766
  - 37 Railway gradient, -.358

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matrix is presented in Table 13, Appendix C, and the correlation coefficients in Table 3.

The factors identified as local-service road, secondary highway, and female drivers correlated significantly with accident rate. While all factors explained 19 percent of the variation in accident rate, these three factors accounted for 16 percent. The unexplained percentage is due to measurement errors, the absence of important variables that were not identified or measured such as driver characteristics and, probably, in large part to the element of chance.

A positive correlation was observed between accident rate and localservice road. Because such facilities carry low traffic volumes, the
accident rate at the accident-only locations was high. For the same reason, Factor C, secondary highway, which represents surfaced highways which
serve both through and local traffic, correlated negatively with accident
rate. Secondary highways do not have a high accident rate because they
carry a high traffic volume. The female driver, as represented by Factor J,
had a negative correlation with accident rate. Women who have consumed
alcoholic beverages normally are accompanied by a male who does the driving. Women drivers seldom drive on the low-class roads where no protective
devices are found.

To gain further insight into the highway-railway grade crossing accident problem, the 21 factors representing accident-only locations were correlated with some measure of total exposure. In this case, total exposure was defined as the inverse of product of the daily train volume, TPD, and daily vehicular volume, ADT. The results of this correlation are presented in Table 4. Factors B and J, local-service road and female driver, correlated similarly with exposure as they did with accident rate. Major railroad facility, Factor A, correlated negatively with exposure.



TABLE 3

CORRELATION OF ACCIDENT RATE WITH THE FACTORS

56 VARIABLE FACTOR ANALYSIS

Factor*	Correlation Coefficient
А	0231
В	+.2537**
С	2097**
D	+.0061
E	<b>+.</b> 0968
F	+.0181
G	0218
Н	0457
I	+.0765
J	2335**
K	0530
L	1424
М	+.0729
N	0315
0	1063
P	0386
Q	+.0103
R	+.0128
S	0105
T	0598
U	+.0262

<sup>\*</sup> A fold-out key to the factors is presented in Appendix D.

<sup>\*\*</sup> Dominant factors.



TABLE 4

CORRELATION OF EXPOSURE WITH THE FACTORS

56 VARIABLE FACTOR ANALYSIS

Factor*	Correlation Coefficient
Α	2717**
В	+.2195**
С	0735
D	+.0859
E	+.1296
F	+.0472
G	01 <sup>l</sup> +1
Н	+.0012
I	+.0437
J	1690**
К	0229
L	<b></b> 0 <i>55</i> 7
M	1091
VI.	0423
0	0691
P	+.0405
Q	+.0029
R	+.0373
S	+.0351
Т	,+.0225
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<sup>\*</sup> A fold-out key to the factors is presented in Appendix D.

<sup>\*\*</sup> Dominant factors.



The relatively large number of exposures resulting in one accident for each location of this classification resulted in the negative correlation. These four factors explained 16 percent of the variation in total exposure while only an additional three percent was explained by the remaining 17 factors.

## Combined Location Factor Analysis

The previous factor analysis was performed on data representing accident locations only to identify those characteristics related to accident situations. To obtain a realistic measure of hazard, a factor analysis was performed on 28 variables common to both accident and non-accident locations. The variables representing no protection, stop signs and rail-road gradient were eliminated because of insufficient data.

Ten significant factors with a latent root of 1.0 or greater were generated. As shown in Table 16, Appendix D, the contribution of these factors to the total variance of the variables accounted for 70 percent of the variance. Means and standard deviations of the study variables, the rotated-factor matrix, the correlations of accident occurrence with the other variables and the factor-score matrix are also in Appendix D. The ten common factors that were generated are described below:

- AA. Local-service road. All variables which describe this factor indicate local access roads.
  - 9 Portland cement concrete, -.371
  - 29 Crossbuck, +.355
  - 31 Flashers, -.740
  - 35 White edge line, -.702
  - 41 Pavement width, -.732
  - 44 Number of businesses, -.359
  - 45 Number of advertising signs, -. 637
  - 55 ADT, -.802

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- BB. Major railroad facility. These variables reflect movement of many trains at relatively high speeds.
  - 40 Number of tracks, +.586
  - 50 Freight train speed, +.510
  - 51 Number of passenger trains, +.805
  - 52 Number of freight trains, +.868
  - 53 Average train speed, +.610
  - 54 Total number of trains, +.938
- CC. Skewed crossing. This factor suggests travel on a major road with the railroad crossing at a wide intersection angle.
  - 42 Advance warning sign, +.513
  - 43 Pavement crossing marking, +.647
  - 46 Minor obstructions, +.540
  - 49 Intersection angle, +.820
- DD. Secondary highway. The highway type described by these variables serves both local and through traffic.
  - 9 Portland cement concrete, -.315
  - 10 Asphalt, +.960
  - 11 Gravel, -.859
  - 41 Pavement width, +.302
  - 47 Number of houses, +.329
- EE. Minimum protection. The dominance of painted crossbucks explains these crossings.
  - 29 Painted crossbuck, +.858
  - 30 Reflectorized crossbuck, -.929

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- FF. Distractions. This factor is described by the roadside development which may distract the drivers.
  - 44 Number of businesses, +.710
  - 45 Number of advertising signs, +.451
  - 47 Number of houses, +.644
  - 56 Average car speed, -.585
- GG. Inadequate alinement. Restrictive vertical and horizontal alinement variables constitute this factor.
  - 36 Highway gradient, +.501
  - 38 Highway curvature, +.751
  - 39 Railway curvature, +.508
  - 56 Average car speed, -. 320
- HH. Low speed railroad location. The low train speeds and volume indicated by these variables describe a minor railroad operation.
  - 39 Railway curvature, +.400
  - 50 Freight train speed, -.743
  - 53 Average train speed, -.701
- II. Inadequate visual warning. These variables suggest lack of view prior to the crossings.
  - 36 Highway gradient, -.434
  - 42 Advance warning sign, -.318
  - 46 Minor obstructions, +.611
  - 48 Sine of line-of-sight angle, -.740
- JJ. Protected crossing. This factor represents the use of a physical barrier when trains are present.
  - 9 Portland cement concrete, +.296
  - 32 Gates, +.916
  - 40 Number of tracks, +.308



These ten factors were then correlated with accident occurrence; that is, whether or not an accident occurred at the crossing location. As shown in Table 5, the dominant factors, local-service road, major railroad facility, secondary highway and distractions explained 22 percent of the variation in accident occurrence. All factors explained 24 percent of the variation in accident occurrence. The coefficients for the four factors are approximately equal. Thus, each factor contributes approximately the same amount to the crossing hazard as measured by accident occurrence.

In the accident-locations-only factor analysis, the local-service road factor correlated positively with accident rate. Because local-service roads carry low traffic volumes, an accident at such a crossing reflects a high accident rate. However, in this factor analysis, local-service road was negatively related to accident occurrence thus confirming that an accident is relatively infrequent at each crossing of this type.

The major railroad facility factor contributed importantly to accident occurrence. Inspection of the correlations between the variables and the factor reveals that train volume correlates higher than train speed. Number of tracks is also highly correlated with this factor.

The secondary highway factor influenced materially to accident occurrence. Distractions, as represented by Factor FF, partially explained accident occurrence. The driver's attention apparently is diverted to the houses, businesses, advertising signs, etc., that exist along the approach to the railroad crossing. As a result, inadequate time remains to see the train or warning device.

Based on the model previously discussed in the Procedure, an estimate of accident occurrence was developed from the results of the combined

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TABLE 4

CORRELATION OF ACCIDENT OCCURRENCE WITH THE FACTOR

28 VARIABLE FACTOR ANALYSIS

Factor*	Correlation Coefficient
AA	2416**
BB	+.2448**
cc	0103
סס	+.2530**
EE	0646
<b>F</b> F	+.1936**
<b>G</b> G	+.0425
HH	0679
п	+.0166
JJ	+.0721

<sup>\*</sup> A fold-out key to the factors is presented in Appendix D.

<sup>\*\*</sup> Dominant factors.



The values of these variables must be reduced to standard-score form for the solution of these equations. This reduction is accomplished with the following relationship:

$$Z = (X - \overline{X})/s$$

where Z = standard score,

X = observed value,

 $\overline{X}$  = mean of the variable, and

s = standard deviation of the variable.

## Regression Analysis

The multiple linear regression analysis utilized in this research investigation is often referred to as "buildup" or "stepwise" regression. The independent variables were selected in order of their ability to predict the dependent variable. However, the program allowed the ordering of the variables and thus permitted the development of practical models. For all equations, train and highway traffic volumes were ordered to permit their inclusion in the multiple regression expressions.

The regression analyses were performed on the 28 variables measured at both accident and non-accident locations. The dependent variable for each equation was accident occurrence; that is, whether or not an accident occurred at the location during the two-year study period.

An equation was developed to account for the various protection devices, train and highway volumes and those additional variables which significantly influenced accident occurrence. This analysis produced the following prediction equation:

2. IH = 
$$+0.149 - 0.376X_{29} - 0.300X_{30} - 0.383X_{31} - 0.331X_{32} + 0.082X_{40}$$
  
+ $0.0223X_{41} + 0.011X_{5/4} + 0.0142X_{55} + 0.024X_{57}$ 



where IH = index of hazard (accident occurrence)

X<sub>29</sub> = presence of a painted crossbuck (0, 1),

X<sub>30</sub> = presence of a reflectorized crossbuck (0, 1),

X<sub>31</sub> = presence of a flasher (0, 1),

X<sub>32</sub> = presence of a gate (0, 1),

X<sub>40</sub> = number of track pairs,

X<sub>41</sub> = pavement width in feet,

X<sub>54</sub> = TPD,

X<sub>55</sub> = ADT/1000, and

X<sub>57</sub> = sum of distractions.

In addition to the protection variables, Equation 2 also includes variables which are a measure of train and highway volumes. The type of rail and highway operations are represented by the variables designated as number of track pairs and pavement width. The number of roadside distractions also proved significant, confirming the results of the factor analysis. The sum of the three distraction variables, houses, businesses and advertising signs, was more significant in this equation than the individual distraction variables. The coefficient of determination, R<sup>2</sup>, for Equation 2 was 19.3 percent.

The regression coefficients of the four protective devices were remarkably similar. It might be inferred from this fact that hazard was relatively independent of the type of protective device. To ascertain the statistical significance of the coefficients for the protection variables, a second multiple regression equation was developed which excluded the four types of crossing protection and included the remaining variables. The coefficient of determination for Equation 3, presented below, was 18.3 percent.



TABLE 6

RESULTS OF MULTIPLE LINEAR REGRESSION AND CORRELATION ANALYSIS

COMBINED DATA

EQUATION 2

Intercept = +0.149

Multiple Correlation Coefficient = 0.193

Standard Error of Estimate = 0.484

Variable*	Net Regression Coefficient	Standard Error
29	3758	.1740
30	3002	•1779
31	3833	<b>.</b> 1866
32	3310	.2198
40	+.0821	.0402
41	+.0223	.0054
54	+.0107	.0026
55	+.0142	.0139
57**	+.0242	.0053

<sup>\*</sup> A fold-out key to these variables is presented in Appendix D.

<sup>\*\*</sup>  $X_{57}$  is equal to sum of  $X_{\mu\mu}$ ,  $X_{\mu5}$ , and  $X_{\mu7}$ .

3. IH =  $0.185 + 0.079X_{40} + 0.021X_{41} + 0.011X_{54} + 0.013X_{55} + 0.024X_{57}$ where IH = index of hazard,

 $X_{\mu_0}$  = number of track pairs,

 $X_{L1}$  = pavement width in feet,

 $X_{\zeta \mu} = TPD,$ 

 $X_{55} = ADT/1000$ , and

X<sub>57</sub> = sum of distractions.

The F-test presented below was used to test the hypothesis that the coefficients for the four protective devices as presented in Equation 2 were not significantly different from zero.

$$F = \frac{(R_k^2 - R_r^2) / (k - r)}{(1 - R_k^2) / (N - k - 1)}$$

where F = calculated F value,

 $R_k^2$  = multiple coefficient of determination for the original equation,

 $R_r^2$  = multiple coefficient of determination for the equation without the test variables.

k = number of independent variables in the original
 equation,

r = number of independent variables in the equation
 without the test variables, and

N = number of observations.

The calculated F value for this data was obtained as follows:

$$F = \frac{(0.193 - 0.183)/(9 - 5)}{(1 - 0.193)/(530 - 9 - 1)} = 1.61$$

The critical value for a 95-percent level of significance with  $(k_-4) = 4$  and  $(N_-k_-1) = 520$  degrees of freedom is 2.39. Because the calculated value is less than the critical value, the hypothesis that the protection coefficients are equal to zero was not rejected.



TABLE 7

RESULTS OF MULTIPLE LINEAR REGRESSION AND CORRELATION ANALYSIS

COMBINED DATA

### EQUATION 3

Intercept = -0.185

Multiple Correlation Coefficient = 0.183

Standard Error of Estimate = 0.486

Variable*	Net Regression Coefficient	Standard Error
40	+.0789	.0396
41	+.0214	.0054
54	+.0110	.0026
55	+.0126	.0134
57**	+.0239	•0053

<sup>\*</sup> A fold-out key to these variables is presented in Appendix D.

<sup>\*\*</sup>  $X_{57}$  is equal to sum of  $X_{444}$ ,  $X_{45}$  and  $X_{47}$ .

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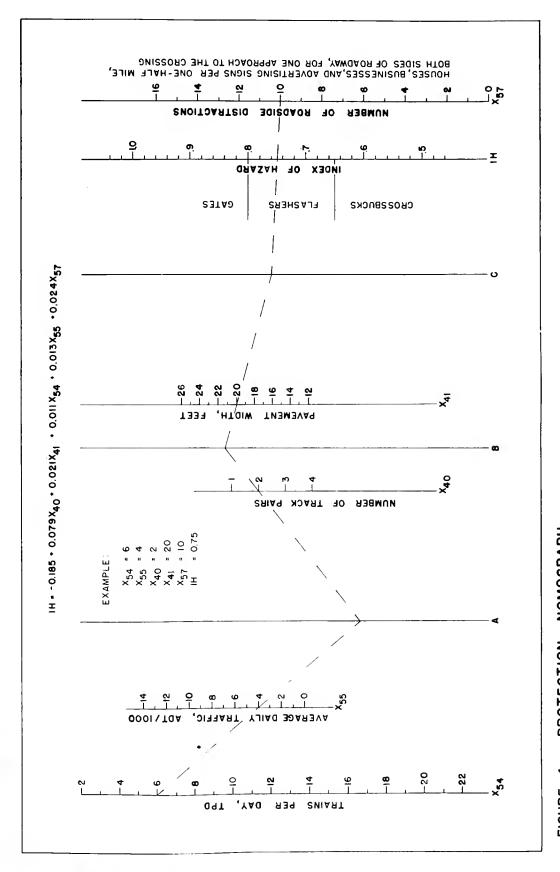


FIGURE 4. PROTECTION NOMOGRAPH

warrants are based on current levels of protection. Painted crossbucks were not included in the nomograph because all crossbucks are required to be reflectorized by state law. Although many painted crossbucks are presently in service, these devices are to be replaced with reflectorized crossbucks when necessary.

The index of hazard and minimum protection warranted for the example shown on Figure 4 is determined in the following manner;

Given: TPD = 6; ADT = 4000; 2 track pairs; 20 ft. pavement width; and 10 roadside distractions.

- 1. Draw a line extending from 6 trains per day through 4/1000 ADT to turning line A.
- 2. From the intersection point on line A, a line is drawn through 2 track pairs and extended to turning line B.
- 3. From this point of intersection, a line is drawn through 20 ft.

  pavement width and extended until it intersects turning line C.
- 4. After connecting this point on line C to the 10 roadside distractions, the index of hazard and minimum type of protection warranted is found at the intersection of this line with the index of hazard scale.

To check the adequacy of Equation 3, the average calculated indices of hazard for the crossings studies were compared to the actual hazard as defined by the number of accident locations, A, per number of locations investigated, N, for each type of protection. The comparison is given below:

Type of Protection	Calculated Average IH	_A/N	Actual IH	Difference	Percent Variation
Painted crossbuck	0.502	155/320	0.484	0.018	3
Reflectorized crossbuck	0 <b>.5</b> 23	66/115	0.574	0.051	9
Flasher	0.774	51/73	0.699	0.075	11
Gate	0.828	12/14 36	0.857	0.029	3



#### CONCLUSIONS

The following conclusions concerning hazard at railroad-highway grade crossings summarize the findings of this research investigation. As actual accident locations were compared to a random sample of non-accident locations, these results can reasonably be applied to all rural grade crossings within the State of Indiana.

- 1. The accident victims are predominantly young male drivers residing in the county in which the accident occurred. They are usually traveling alone and not under the influence of alcohol. More than one half of them are injured, and about one out of seven are killed.
- 2. Trucks account for more than one quarter of the accident vehicles. Seventeen percent of all vehicles involved in accidents have evidence of mechanical defects. The possibility of the driver hearing a warning bell or train whistle is reduced because the windows are closed on most vehicles. The majority of accidents occur at relatively low car speeds and at moderate train speeds.
- 3. Most accidents occur during the fevorable driving conditions of clear weather, daylight hours, and dry pavements. However, the number of accidents per unit time and per unit exposure is probably greater for ice and snow conditions and for wet pavements than for dry pavement conditions.
- 4. The regression equation, generated by factor analysis (Equation 1), relates accident occurrence to four factors which were identified

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- as local-service road, major railroad facility, secondary highway, and distractions. All four factors accounted for approximately the same amount of variation, which totaled 22 percent, in accident occurrence.
- 5. The type of protection is not important as a variable in the equations developed by regression analysis for the prediction of index of hazard.
- sion technique (Equation 3) identifies number of track pairs, highway pavement width, train volume, average daily traffic volume, and the sum of distractions (number of houses, businesses, and advertising signs) as important variables for the prediction of index of hazard. This equation explains 18 percent of the variation in accident occurrence.
- 7. Warrants for the installation of protective devices at railhighway crossings, based on the current standard of protection
  used in Indiana, are indices of hazard of below 0.65 for reflectorized crossbucks, 0.65 to 0.80 for flashers, and above 0.80 for
  gates. These values are applicable for crossings rated by
  Equation 3.
- 8. Prediction of index of hazard is possible with Equation 1 which was developed with factor analysis. However, the simplicity of Equation 3 developed by multiple linear regression techniques and its almost equal dependability makes it more practical to use.
- 9. This investigation of many roadway, railroad, traffic, and environmental variables permitted only an explanation of approximately 20 percent of accident occurrence. This finding lends support to the conclusion of many authors that railroad-highway grade crossing

accidents are predominantly the result of driver characteristics and/or chance.

#### SUGGESTIONS FOR FURTHER RESEARCH

The railroad-highway grade crossing involves a large and important area of accident prevention. This thesis did not attempt to cover completely the entire topic. Therefore, the following suggestions are offered as possibilities for further research.

- 1. This study analyzed rural locations only. The total number of railroad-highway grade crossing accidents are approximately distributed evenly between rural and urban areas. A similar study on urban locations is probably warranted. An urban study should include such additional variables as illumination, stop sign control, coordinated traffic signal control, and other variables pertinent to urban locations.
- 2. Investigation of the non-linearity in the parameters and/or the variables may offer increased precision in the estimation of hazard. The equations presented in this research assume linear relationships.
- 3. Prompt investigation of accidents may yield valuable information regarding driver behavior. Data concerning the causes of driver carelessness would permit better driver education programming.
- 4. Experimentation and analysis of stop sign and traffic signal control versus flashers or gates, especially in urban areas, may offer an increased measure of protection. Previous studies have included only observations on these techniques.

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BIBLIOGRAPHY

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- 10. Crecink, W. J., "Evaluating Hazards at Railway Grade Crossings",

  Proceedings, Highway Research Board, 1948, Washington, D. C.
- Griffin, H. W., "Some Observations on the Value of Time Saved to Motorists", <u>Proceedings</u>, Highway Research Board, 1948, Washington, D. C.
- 12. Hardjodipuro, Suwarto, "Railroad Grade Crossing Protection", C. E. 697, Purdue University, 1958, Lafayette, Indiana.
- 13. Harman, H. H., <u>Modern Factor Analysis</u>, Chicago, The University of, Chicago Press, 1960.
- 14. Hay, W. W., An Introduction to Transportation Engineering, Wiley & Sons, Inc., 1961, New York, New York.
- 15. Hays, Joseph H., "Can Government Curb Grade Crossing Accidents?",

  <u>Traffic Safety</u>, April 1964, Chicago, Illinois.
- 16. Hedley, W. J., "The Achievement of Grade Crossing Protection",

  Proceedings, American Railway Engineering Association, 1949,

  Washington, D. C.
- 17. Indiana State Police, <u>Indiana Traffic Deaths 1963</u>, 1964, Indianapolis, Indiana.
- 18. Interstate Commerce Commission, Bureau of Transport Economics and Statistics, Statement No. 6305, "Rail-Highway Grade Crossing Accidents for the Year Enging December 31, 1962," 1963, Washington, D. C.
- 19. Interstate Commerce Commission Issues Report on Highway-Rail Accident Study", <u>Traffic Safety</u>, April 1964, Chicago, Illinois.
- 20. Interstate Commerce Commission, "Prevention of Rail Highway Grade Crossing Accidents Involving Trains and Motor Vehicles", Docket No. 33440, 1964, Washington, D. C.



- 21. Iowa State Commerce Commission, Summary, Highway Railroad Grade Crossing Accidents in the State of Iowa, 1958, Des Moines, Iowa.
- 22. Iowa State Highway Commission, "Deficiency Rating of Iowa Primary Highway-Railroad Crossings", 1957, Ames, Iowa.
- 23. Johnson, Arnold A., "Maximum Safe Vehicle Speeds at Railroad Grade Crossings", <u>Traffic Engineering</u>, June, 1958, Washington, D. C.
- 24. Marks, Harold, "Railroad Crossing Protection: How Much Is Justified?",

  Proceedings, The Twelfth California Street and Highway Conference,

  The Institute of Transportation and Traffic Engineering, University

  of California, 1960, Berkeley, California.
- 25. McEachern, Cooper, "A Study of Railroad Grade Crossing Protection in Houston", Proceedings, Institute of Traffic Engineers, 1960, Washington, D. C.
- 26. McLaughlin, W. A., <u>Highway-Railway Grade Crossing Treatments</u>,

  <u>Technical Publication No. 13</u>, Canadian Good Roads Association,

  October, 1960, Ottawa, Canada.
- 27. National Committee on Uniform Traffic Laws and Ordinances, <u>Uniform</u>

  <u>Vehicle Code</u>, 1962, Washington, D. C.
- 28. Ohio Legislative Service Commission, "Grade Crossings in Ohio", Staff Research Report No. 23, 1957, Columbus, Ohio.
- 29. Oppenlander, J. C., "Multivariate Analysis of Vehicular Speeds",
  a <u>Thesis</u>, submitted to the University of Illinois for the degree of
  Doctor of Philosophy, 1962, Urbana, Illinois.
- 30. Oregon State Highway Department, "Relative Hazards at Railroad Grade Crossings on State and Federal Aid Highway Systems", 1956, Salem, Oregon.
- 31. Peabody, L. E. and Dimmick, T. B., "Accident Hazards at Grade Crossings", Public Roads Vol. 22, No. 6, August 1941, Washington, D. C.

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- 32. Raymond, W. G., Riggs, H. E., and Sadler, W. C., <u>Elements of Rail-road Engineering</u>, Wiley & Sons, Inc., 1947, New York, New York.
- 33. "Safety Program for Railroad Grade Crossings", <u>Traffic Digest and Review</u>, Traffic Institute, Northwestern University, September 1964, Evanston, Illinois.
- 34. Stanford Research Institute, <u>Allocation of Cost of Proposed Railway-</u>
  <u>Street Grade Crossing Separation in Burbank, California, Stanford</u>
  University, 1955, Stanford, California.
- 35. United States Bureau of Public Roads, "Policy and Procedure Memorandum 21-10", 1958, Washington, D. C.
- 36. United States Department of Commerce, Manual on Uniform Traffic

  Control Devices for Streets and Highways, 1961, Washington, D. C.
- 37. Vanderstempel, Theodore M., "Protection at Railroad Grade Crossings by Crossbucks."
- 38. Versace, John, "Factor Analysis of Roadway and Accident Data",

  Highway Accident Studies, Highway Research Board Bulletin 240, 1960,

  Washington, D. C.
- 39. Woo, J. C. H., "Correlation of Accident Rates and Roadway Factors",

  Joint Highway Research Project, Purdue University, <u>Final Report</u>,

  1957, Lafayette, Indiana.
- 40. Wortman, R. H., "A Multivariate Analysis of Vehicular Speeds on Four-Lane Highways", a <u>Thesis</u>, submitted to the University of Illinois for the Degree of Master of Science, 1963, Urbana, Illinois.
- 41. Wyatt, George H., <u>Testimony</u>, Interstate Commerce Commission Docket No. 33440, 1964, Washington, D. C.

### COMPUTER PROGRAMS

- 42. "Correlation Program", BIMD 2D, Statistical Laboratory Program,
  Purdue University.
- 43. "Factor Analysis", HIMD 3M, Statistical Laboratory Program,
  Purdue University.
- 44. "Stepwise Regression", BIMD 2R, Statistical Laboratory Program,
  Purdue University.

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# APPENDIX A

Protection Standards

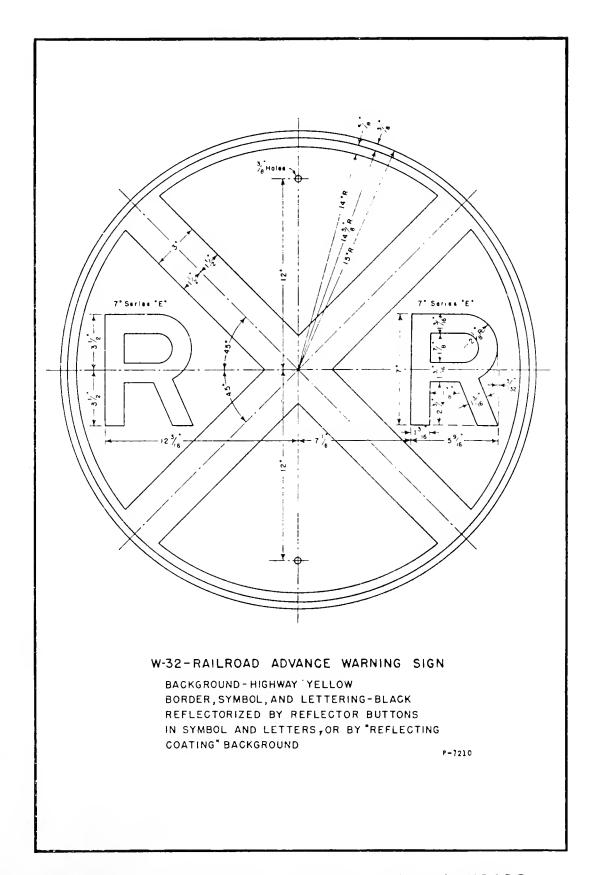
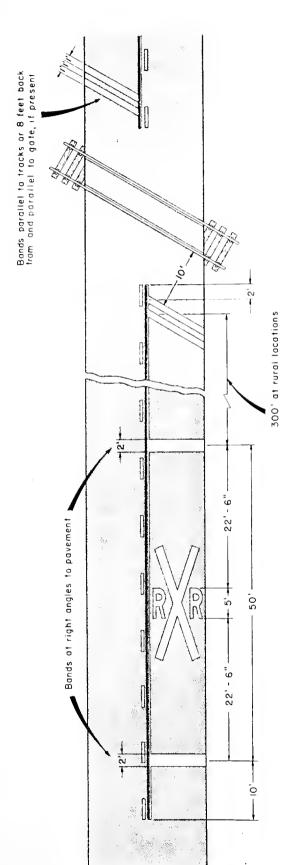
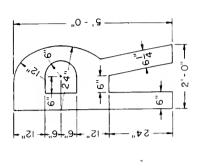
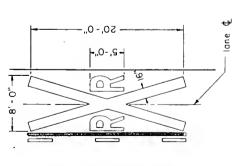


FIGURE 8 ADVANCE WARNING SIGN STANDARD (SOURCE: "RECOMMENDED STANDARDS FOR RAILROAD-HIGHWAY GRADE CROSSING PROTECTION," BULLETIN NO. 5, ASSOCIATION OF AMERICAN RAILROADS.)





The transverse spread of the "X" may vary according to lane width. A three-lane roadway should be marked with a center line for two-lane apperation on the opproach to a crossing. On a four-lone road the transverse bands should extend across the two right-hand lanes only to the center line, and a 10-foat "X" should be centered in the right half of the pavement. On roadways where one half the povement width (or the width assigned to traffic in one direction) exceeds 30 feet, two or more of the RXR symbols should be symmetrically placed side by side on the right half of the pavement.



PIGURE 9 ROADWAY PAVEMENT MARKINGS STANDARD (SOURCE: MANUAL ON UNIFORM TRAFFIC CONTROL DEVICES FOR STREETS AND HIGHWAYS, NATIONAL JOINT COMMITTEE ON UNIFORM TRAFFIC CONTROL DEVICES.)

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### APPENDIX B

Field Equipment and Sample Data Sheet



Code	Number

## FIELD WORK SHEET

Type	of Protection:	Vehic	ular VolumeADT
A.	Painted X-bucks.		
$B_{\bullet}$	Reflectorized X-bucks.	Misce	llaneous:
c.	Flashers Only.	Α.	No. of Tracks
D.	Flashers & Gate.	₿•	Pavement Width
E.	Other	C.	Roadway Warning Sign
F.	Condition	D.	Roadside Warning Sign
G.	Side Lane Markers	E.	Number of Roadside Businesses
Grade	<b>:</b>		•
Hig	ghway	F.	Number of Advertising Signs
Rai	ilway		•
Curva	ature:	G.	Presence of Minor Obstructions
Hig	ghway•		(trees, grass, etc.)
Rai	ilway•	н.	No. of Houses
Туре	of Highway:		
Calcu	ulations:		

Figure 11. Sample Data Sheet



APPENDIX C

Accident Location Factor Analysis Data

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TABLE 8

MEANS AND STANDARD DEVIATIONS OF THE STUDY VARIABLES

Variable*	Mean	Standard Deviation	Variable*	Mean	Standard Deviation
1	0.2664	0.4429	29	0.5294	0.5000
2	5.183	4.480	30	0.2284	0.4205
3	0.2803	0.4940	31	0.1765	0.3819
4	0.0623	0.2421	32	0.0415	0.1998
1 2 3 4 5 6 7 8 9	1.360	0.9025	32 33 34	0.0173	0.1306
6	24.14	18.40	34	0.0969	0.3078
7	40.62	22.40	35	0.1038	0.3055
8	0.1730	0.3789	36	0.8782	1.630
9	0.0727	0.2600	37	-0.0066	0.2376
10	0.7474	0.4352	38	0.2318	1.404
11	0.1834	0.3877	39	0.1488	0.7786
12	0.5744	0.4953	40	1.429	0.7091
13	0.2734	0.4465	41	19.72	6.096
14	0.7405	0.4391	42	0.6851	0.6410
<b>15</b> .	0.3633	0.4818	43	0.0969	0.4137
16	0.7059	0.4564	44	1.609	1.980
17	0.0588	0.2357	45	0.6471	1.404
18	0.8650	0.4320	46	0.6990	0.6842
19	36.30	15.45	47	3.080	3.077
20	0.6228	0.4855	48	0.5824	0.372
21	0.1384	0.3459	49	94.13	73.98
22	0.1419	0.3495	50	40.29	14.78
23	0.1453	0.3530	51	2.941	3.060
24	0.1177	0.3228	52	9.834	7.123
25	0.1557	0.3632	53	44.19	16.60
26	0.1626	0.3697	54	12.976	9.776
27	0.1557	0.3632	55	1,185	2,357
28	0.1176	0.3228	56	39.16	12.20

<sup>\*</sup> A fold-out key to these variables is presented on page 92.

	4.	

TABLE 9

CORRELATION OF ACCIDENT\_RATE WITH THE OTHER VARIABLES

Variable*	Correlation Coefficient	Variable*	Correlation Coefficient
1	+.0437	29	0266
2	+.0956		+.0662
1 2 3 4 5 6 7 8 9 10	0011	30 31 32 33 34 35 36 37 38 39	1779
4	<b></b> 0660	32	0744
5	+.0299	33	+.4160
6	0349	34	0661
7	+.1441	35	1311
8	<b>+.</b> 01 <i>5</i> 1	36	+.1143
9	<b>0</b> 988	37	0085
10	<b>229</b> 6	38	+.0547
11 12	+,2926	39	<b></b> 0260
12	0703	40	0283
13	0190	41	<b></b> 2869
14	0668	42	0877
15 16	<b></b> 0699	43 44 45 46 47	<b></b> 0583
16	0905	44	2005
17 18	<b>+.</b> 0668	45	<b>139</b> 8
18	0136	46	+.0395
19	0002	47	<b></b> 1292
20	0303	48	+.0032
21	0152	49	<b></b> 0 <i>5</i> 76
22	0889	50	+.0427
23 24	0268	51	+.0577
24	0384	52	+.0386
25 26	+.0463	53	+.0617
	+.0026	50 51 52 53 54 55 56	+.0439
27	+.1251	55	2079
28	0843	56	1117

<sup>\*</sup> A fold-out key to these variables is presented on page 92.

TABLE 10

CORRELATION OF TOTAL EXPOSURE WITH THE OTHER VARIABLES

/ariable*	Correlation Coefficient	Variable*	Correlation Coefficient	
1	+.0620	29	0276	
1 2 3 4 5 6 7 8	+.0223	30	+.0539	
3	+.0221	30 31	1314	
4	<b></b> 0376	32	0523	
5	+.0773	32 33 34 35 36 37 38	+.4367	
6	1004	34	0212	
7	+.1743	35	1074	
8	+.0122	36	+.0796	
	0770	37	0003	
10	1732	38	+.0367	
n	+.2505	39	0340	
12	0353	39 40	+.1073	
13	0140	41	2182	
14	0610	42	0638	
15	0288	43	+.0096	
16	0026	1414	1520	
17	+.0239	45 46	1067	
18	+.0219	46	+.0963	
19	+.0309	47 48	0978	
20	0243	48	+.0805	
21	0022	49	+.0236	
22	0115	50	+.1402	
23	<b></b> 0456	51	+.2212	
24	0589	52	+.2844	
25	0196	53	+.1907	
26	+.0124	50 51 52 53 54 55 56	+.3010	
27	+.1719	55	1535	
28	0607	56	1296	

<sup>\*</sup> A fold-out key to these variables is presented in Appendix D.

#### 56 VARIABLE ROTATED-FACTOR MATRIX

374					F.	ctor*				
Vari-		В	С	D	E	F	G	Н	I	J
able	A +.0676			+.0742		+.0999				0564
1	+.2183			0673		+.1111		+.0805		
	0019			0747		+.0150			0759	
3 4						+.0150			0132	
	+.0092			+.0289						
		+.0598				+.0330			+.0315	1
	2411			+.0260		+.0352				
7	+.1228			+.0122		0557		0094	4	+.0270
8	+.1267			1576		1132			+.1017	+.1132
	+.0831		4941			+.0238			3138	
10	+.0062			+.0135		0498			+.0331	
11	0511			+.0009		+.0454			+.1961	
	+.0960	0420	+.0329	8736	0116	+.0143			+.0144	
	+.0377			+.8565		+.0283			+.0110	
14	+.0383		0341			0354			+.0347	
15	+.1705	0618	+.0868	0151		+.0519				
16	+.0748	0942	+.1326	+.6115	1498	0746	+.2117	0821	+.0176	+.0797
17	+.0259	+.0207	0334	+.0199	2258	0574	0560	0143	1261	6584
18	+.0333			0671		+.0327			+.0398	
19	0739				+.0102			+.0192		
20					+.0144					
		+.0361				0128				
22	+.0492				+.0056					
	0938			- 0994		+.0138				
	0827				+.0137					
	0383				1349					
		0017				+.0568				
				+.0305		+.0417				
		0275				0335				
1										
29	0415				+.0699					
30	+.0374			+.1153		0177			0542	
	0504			0147		+.0289			0044	
	+.1696		+.0384			+.0357		0747		1
33	+.0324		0957	+.0200						7363
34	+.0711		+.1740							
35	2494		+.0607	0044	+.0996	1432	0366	0055	1070	1145
		+.1130				0432	+.0675	0210	+.6646	0540
	0875			+.0209		0703				
38		+.0765				0226				
					+.0403					0167
		+.1167			0349					
41	+.0075				+.0760					1
42	1880				+.1787			1532		+.0953
43	+.0379				0285					
44					7381					
45 46					4445	0833	+.1213	0112	0414	0937
46	+.1092	+.1272	0133	+.0749	+.0149	7776	0380	+.0371	0688	+.0106
47	1073			0321		+.0108				
48	+.2628				+.1728					
49	0338			0293		7877			+.0340	
50	+.2002			+.0120		+.1950				
51	+.6653			1162		+.0600				
52	+.7967			+.0803		+.0070		0604		
53		+.0349				0622		0493		
54	+.8468			+.0057		2956		0560		=.0331
55	+.0066			+.0184		+.0064				
56	2069	_		+.0357				+.0018		
			1.0000	1.000	10 1217	0,00	1.0012	1.0010		1.01-1

<sup>\*</sup> A fold-out key for these variables and factors is presented on page 92.

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# 56 VARIABLE ROTATED\_FACTOR MATRIX

Vari-						Factor					
able	K	L	M	N	0	P	Q	R	S	T	U
1	+.4484	1934	0003	3269	0647	+.1588	0326	3325	+.1917	+.2490	+.078
2	+.3686	0982	0049	1631	+.0333	2047	0596	+.0926	2194	+.0410	108
3	0076	+.0731	+.0978	+.1349	0154	+.0816	0931	7305	1031	+.0308	+.059
4						0799					
						0270					
5						+.1726					
7						1632					
8						2891					
						+.0037					
9											
10						0044					
11						+.0403					
12						0265					
13						+.0954					
14						+.0856					
15	+.0663	+.1478	1694	+.2741	,0964	+.0688	0711	+.1629	0538	1505	+.59
16	+.0498	+.1611	1900	+.0617	+.0883	0943	+.1137	+.0107	1000	0775	+.16
17						+.0433					
18						+.0336					
19						0030					
20						+.0260					
21						2110					
22						0824					
23	0282					0714					
24	+.0297					0720					
25		1736				+.8319					
26	+.1070	0794	+.0074	+.8154	1095	0868	+.1441	1325	+.1555	0840	+.01
27	0357	2966	0269	3618	4252	4043	+.3531	+.1593	0039	2833	+.04
28						1158					
29						+.0963					
3Ó						0083					
31						1164					
32						+.0585					
33						1273					
34				1105	2006	+.0219	1000	0666	1 2657	1177	
		+.2239									
35	T.U20U	0105	7.0312	T.0830	7.0033	0627	0134	2020	1410	0704	T.12
36						+.0745					
37	+.1010	1426	+.0819	0189	+.1998	2641	0591	3581	4194	1371	01
38						+.0211					
39	1380	1771	3116	+.2170	0822	1479	3773	+.1392	0908	+.2612	+.11
40	+.0612	+.2070	0251	0124	0062	+.0036	+.1582	0707	1928	0656	+.10
41						+.0893					
42						+.0135					
43						+.0698					
44						+.0379					
45						+.0649					
46											
47						+.0098					
						+.0993					
48		+.0037				+.0734					
49		+.0205				+.0209					
50				+.0508		+.0422					
51	+.0024	+.0576	+.4538	0234	0261	0810	0468	+.0307	0272	+.0124	+.07
52						0263	+.0239	+.0159	0062	0402	05
53	0159	+.0905	+.8641	+.0255	+.0163	+.0460	+.0079	- 0562	_0510	+_0068	+.05
54	0627	- 0440	+ 3002	+ 0016	+ 0222	0016	+ 0060	+ 0200	0717	0280	ال∆
55	_ 01 K/L	+ 0353	12/10	יימיוט	+ 0280	0051	00009	0070	יונטיי	- 0209	1.00
56	- 001P	1000	- 16.47	U404	0104	0021	1-00/77	0010	0001	T.U4)	7.02
70	T. OUTO	07/0	TOYOT	±•1000	OTQQ	+.0297	T. 0474	0390	11095	1315	<b></b> 07



TABLE 12

CONTRIBUTIONS OF THE 21 PRINCIPAL FACTORS

Factor*	Eigenvalue	Percent of Total Variance	Cum. Percent of Total Variance		
A	4.96	8.86	8.86		
B C	3.43	6.14	15.00		
C	2.65	4.73	19.73		
D	2.45	4.37	24.10		
E F	2.31	4.13	28.23		
F	2.17	3.87	32.10		
G	2.04	3.66	35.76		
Н	1.83	3.26	39.02		
I	1.69	3.02	42.04		
J	1.63	2.90	44.94		
K	1.57	2.81	47.75		
L	1.51	2.69	50.44		
M	1.39	2.48	52.92		
N	1.34	2.40	55.32		
0	1.31	2.33	57.65		
Ė	1.23	2.19	59.84		
Q	1.21	2.16	62.00		
R	1.18	2.11	64.11		
O P Q R S	1.11	1.98	66.09		
T	1.06	1.89	67.98		
Ū	1.04	1.85	69.83		

<sup>\*</sup> A fold-out key to these factors is presented on page 92.



### 56 VARIABLE FACTOR-SCORE MATRIX

Vari-					Fact	tor*				
able	A	В	С	D	E	F	G	H	I	J
	+.0734	+.0004	0731	0031	+.0163	+.0334	+.0361	+.0002	+.0282	+.0054
1 2	+.0904				1208				0525	
3	+.0037	+.0572			0065			+.0143	0550	0256
3 4	+.0327	+.0213	+.0498	+.0700	0391	0095			+.0039	
5 6	+.0319	+.0154	0350	+.0231	0010	+.0261	+.0670	0169		
6	0349	+.0082	+.1003	0386	+.1797	+.0326	+.1579	+.0088	2154	0610
7		+.0040			0453			+.0429	0078	0039
7 8	0275	0533	0322	0433	0985	0552	2611		+.0553	+.0593
9	+.0674	0842		0221	+.0013	0170		0425	1714	+.1039
10	+.0106	+.0190	+.4777	0007	+.0130	+.0234			+.0330	
11	0579	+.0318	3507	+.0168	0093	0084	+.0451	0046	+.0843	0594
12	+.0608	0294	+.0423	4103	+.0687	+.0184	+.0524	+.0090	011?	0130
13	+.0202	0370	+.0102	+.4293	+.0021	+.0064	0227	+.0175	+.0045	0294
14	+.0383	0356	0007	0424	0578	0306	+.0157	0359	+.0327	+.0288
15			+.0005						+.0182	
16		0030			0893				+.0477	
17	0238	+.0557	0057	+.0156	1020	0146	0115	+.0165	1079	3732
18	+.0109	0172			+.0537				+.0070	
19	0170	0884			+.0108			+.0091	+.0981	0627
20	+.0112	+.0327	0392	0295	0096	+.0076	+.4045	0813	0165	+.0171
21.	+.0091	+.0062	0809	+.0148	0808	0229	+.4000	+.1109	0227	+.0824
22	+.0118	+.0116	0166	+.0626	0559	0008	0126	+.0052	+.0098	+.0121
23	0165	0056	+.0222		+.0342				0623	
24	0310	+.0525	+.0681		+.0205		+.0122	+.0074	0441	
25	+.0138			+.0221	0684	0303	0251	+.0387	+.0761	+.0531
26	+.0332	+.0085	0234		+.0067		+.0091	0317		
27	+.0462	0653	+.0322		+.0592			0133		
28	0566				+.0110					
29	0029	+.1110			+.0370					
30	+.0335		0015	+.0442	0050	+.0049				
31	0294		0308	+.0095	0538	+.0068			+.0513	
32	+.0393		0173	0550	+.0165	+.0042	0285		+.0400	
33	0353		+.0266		+.0296		0336	0214	+.0513	4155
34	+.0264		+.0668	1040	0938	0884	+.0207	0828	+.0863	+.1393
35	0900			0123	+.0637	0634	0315	+.0270	0155	0657
36	0941		+.0106	0079	+.0603	0250	+.0145	0508	+.3932	0001
37			0037							
38			0629							
39			+.0093							
40			+.0424							
41	+.0803	2596			+.0999					
42			0138							
43			+.0212							
44			0119							
45			1040							
46			0217							
47			+.0600							
48		1264			+.0902					
49		+.0090			+.0246					
50	0607		+.0213							
51	+.2153	0296	+.0204	F.0716	+.0488	T.0705	U124	0020	0455	7.0000
52			0020							0848
53			+.0141							0121
54			0110							
55			0537							
56	0012	0823	+.0319	0038	+.2815	0250	+.0296	+.0442	1812	+.0451

# 56 VARIABLE FACTOR SCORE MATRIX

Vari-					F	actor*					
able	ĸ	L	M	N	0	P	Q	R	S	Т	Ü
1					0579						
2	+.2998	0955	0512	1029	+.0192	1666	0536	+.0466	1899	+.0165	061
3	0642	+.0330	+.0098	+.0789	0330	+.0674	0438	4658	0745	0074	+.070
3 4					+.0353						
5					+.0843						
5					0825						
7					0022						
8		0203			+.0675						
9					0645						
1ó	+.0031				0019						
11					+.0561						
12					0960						
13					0096						
14					+.0478						
15					+.0453						
16					+.0320						
17					0187						
18	+.1433	+.0918	0144	1504	+.1080	+.0206	+.0557	0146	+.1972	0132	+.077
19	+.0811	+.1132	+.0905	+.0174	0902	+.0091	1364	+.0279	+.1661	+.1007	0994
20					+.1358						
21					0699						
22					+.5511						
23					+.0465						
24	0163	0229	+.0283	+.0015	+.0472	0376	+.0893	+.0378	0501	+.6576	0239
25	0093	1520	+.0211	0748	0520	+.6244	+:0581	+.0162	0525	0871	0113
26	+.0691	0747	0201	+.6032	0853	0778	+.1235	0629	+.1115	0432	+.0106
27	+.0740	1690	0713	2686	3252	3177	+.2344	+.0823	0257	2995	0311
28					0266						
29					+.0312						
30					+.0097						
31 32					+.0219						
32					0634						
33	1326	0193	+.0009	0775	0540	0799	+.0131	0244	+.0462	0287	+.0061
34					2113						
35	0144	0104	+.0718	+.0294	0332	0505	0193	0523	0641	0699	+.0313
36					0765						
37	+.0982				+.1157						
38					2209						
39		1551	0860	+.2089	0457	0949	2763	+.1134	0791	+.2172	+.0639
40		+.1115	1372	0021	0280	+.0211	+.1073	0894	1156	0436	+.0772
41		+.0579	0550	0727	0336	+.0655	0206	+.0593	+.0754	0587	0516
42	+.0084	1401	+.0973	0151	+.1464	+.0285	+.1190	+.0876	0003	7.0085	+.Z181
43		1068	0462	+.0214	0561	+.0282	0469	0228	0997	0488	0861
144	+.0426		+ 0097	T.0150	+.0939	T.0031	0176	+ OL74	T-0199	0300	UO79
45 46	T. U250	1058	T-0372	1.0018	+.0052	00042	1142	T-0455	TTC3	0274	7.0404
					0667						
47 48					0606						
49					+.1129						
50					+.1360						
51					0362						
52					+.0207						0479
53					+.00207						+.0665
54					+.0148						_
55					0095						
56	- 0336	0666	+ 0787	+ 47133	0907	+.0126	+.0065	+ 07778	_ 1102	_ 0272	0837
الر	0770	0005	1.0101	وربس	0907	المدلاء	1.0005	1.0440	- • 11.72		007/

#### APPENDIX D

#### Combined Location Factor Analysis

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TABLE 14
MEANS AND STANDARD DEVIATIONS OF THE STUDY VARIABLES

Variable*	Mean	Standard Deviation
9	0.0434	0.2039
10	0.6019	0.4900
11	0.3585	0.4800
29	0.6038	0.4896
30	0.2170	0.4126
31 32	0.1377	0.3450
32	0.0264	0.1605
35 36	0.0735	0.2613
36	0.9913	1.707
38	0.1906	1.254
39	0.1094	0.644
40	1.319	0.601
41	18.64	5.225
42	0.7038	0.561
43	0.0698	0.332
144	1.251	1.732
45	0.4057	1.129
46	0.7321	0.583
47	2.555	2.729
48	57.98	38.46
49	92.60	56.73
50	39.62	14.26
51	2.417	2.901
52	8.566	6.560
53	42.75	16.23
54	11.08	9.06
55	806.7	2,102.9
56	40.34	10.73

<sup>\*</sup> A fold-out key to these variables is presented in Appendix D.

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TABLE 15
28 VARIABLE ROTATED\_FACTOR MATRIX

Vari-					Fac	tor*				
able	AA	BB	CC	DD	EE	FF	GG	НН	ĮI	JJ
9	3707	+.1151	1714	3152	0914	0196	1227	2076	+.2618	+.2958
10	1040	+.0432	+.0708	+.9600	0459	+.1199	+.0296	0099	0208	0143
11	+.2641	0889		8585	+.0853	1111	+.0246	+.0965	0888	1103
29	+.3549	0583	+.0170	0864	+.8580	0521	0331	1157	0704	1435
30	+.1973	+.0165	+.0263	+.0412	9286	0220	0493	0526		
31	<b></b> 7398	+.0160	0380	+.0634	0781	+.0712	+.0208	+.1990	+.0956	1192
32		+.1011				+.0389				
35	7018	1772	+.2174	+.0852	+.0077	0718	0122	+.1565	+.0040	+.0430
36	+.1637	+.0168	+.0982	1025	+.0180	0204	+.5009	+.1891	4339	+.0118
38	+.0280	0557	0465	+.0123	+.0142	+.0256	+.7514	+.0602	+.1192	+.0488
39	2110	0159	+.0055	+.0953	0036	1026	+.5076	3998	0515	1037
40	+.0862	+.5862	0540	+.1278	+.0996	+.1221	+.0214	0700	1086	+.3076
41	7315	0092	0472	+.3016	+.0198	0450	0864	1365	0322	+.0959
42	1727	1505	+.5131	+.1288	0254	1488	1963	+.2593	3184	+.0607
43	2564	+.0694	+.6472	+.0644	+.0905	+.0722	+.0540	2474	+.1144	0123
44	3592	+.0216	0516	+.1500	+.0320	+.7096	0778	0761	+.0569	0032
45	6373	0618	+.1469	+.0055	0478	+.4508	0057	1464	0984	+.0574
46	+.1502	+.0862	+.5397	0305	+.0363	0358	+.1419	0201	+.6106	+.0190
47	0579	0544	+.0084	+.3290	0383	+.6438	1122	+.1702	+.0753	+.1061
48	+.0273	+.2338	0866	0456	+.0804	0402	+.0065	0892	7396	+.0501
49	+.0441	+.0236	+.8197	0040	0735	0182	0226	+.0054	+.0932	0397
<b>5</b> 0			1680		0420	0416	+.0566	+.7431	+.0037	0084
51	0056	+.8047	0662	+.0333	<b>0</b> 068	+.0014	0136	+.2527	0269	+.0989
<b>5</b> 2	+.0164	+.8681	0019	0021	0766	0071	0589	+.0492	0929	0833
53	0150	+.6103	+.0163	0465	0280	0168	+.0697	+.7013	+.0156	+.0400
54	+.0353	+.9382	+.1856	0029	0454	0020	0218			0235
55	8018	+.0431	+.0256	+.0241	+.0141	+.1021	+.0379	1328		+.0078
<b>5</b> 6	2740	1863	+.0469	+.2152	+.0112	5846	3197	+.0993	+.0773	+.0612

<sup>\*</sup> A fold-out key to these factors and variables is presented in Appendix D.

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TABLE 16
CONTRIBUTIONS OF THE 10 PRINCIPAL FACTORS

Factor*	Eigenvalue	Percent of Total Variance	Cum. Percent of Total Variance
AA	4.19	14.96	14.96
BB	3.88	13.84	28.80
CC	1.97	7.04	35.84
DD	1.81	6.47	42.31
EE	1.70	6.08	48.39
FF	1.50	5.34	53.73
GG	1.29	4.61	58.34
НН	1.18	4.22	62.56
II	1.07	3.83	66.39
JJ	1.04	3.71	70.10

<sup>\*</sup> A fold-out key for these factors is presented in Appendix D.

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TABLE 17

CORRELATION OF ACCIDENT OCCURRENCE WITH THE OTHER VARIABLES

Variable*	Correlation Coefficient
9 10	+.1444 +.3194
11 29 30	3808 1683 +.0226
31 32 35	+.1 <i>5</i> 15 +.0944
36 38	+.1693 0714 +.0320
39 40 41	+.0606 +.1877 +.2926
42 43	0221 +.0810
44 45 46	+.2118 +.2399 0471
47 48	+.2022 +.0194
49 50 51	+.0328 +.0728 +1905
52 53 54	+.1923 +.1142
55 56	+.2115 +.2433 1361

<sup>\*</sup> A fold-out key for these variables is presented in Appendix D.

TABLE 18
28 VARIABLE FACTOR\_SCORE MATRIX

Vari-	Factor *									
able	AA	BB	CC	DD	EE	FF	GG	HH	II	JJ
9	1365	+.0807	1156	2150	0430	0556	0745	1760	+.2031	+.2454
10	+.0679	+.0080	0107	+.4945	+.0161	0255	+.0530	+.0062	0118	0665
11	0125	0407	+.0574	4201	+.0011	+.0523	0209	+.0664	0728	0357
29	+.0776		+.0142							
30	+.0971	+.0039	+.0263	+.0011	5817	+.0003	0360	0917	0550	0769
31	2507	0080	0613	0357	0060	0055	+.0567	+.1541	+.0715	1628
32			+.0399				+.0470			
35	2240	0793	+.0961	0255	+.0331	0858	+.0362	+.1569	0232	+.0182
36	+.0202	0620	+.1124	0313	0290	+.0197	+.3732	+.1374	3162	+.0441
38	0197	0483	0492	+.0381	+.0081	0239	+.6021	+.0844	+.1260	+.0762
39	0938	0764	0313	+.0591	0233	1484	+.3999	2676	0243	
40			0134							
41	2143	+.0347	0681	+.0924	+.0428	1324	0237	0873	0189	+.0273
42	0275	1118	+.3233	+.0265	0206	0567	1418	+.2023	3030	+.0689
43	0542	+.0724	+.3401	0289	+.0539	+.0291	+.0331	<b>1</b> <i>5</i> 78	+.0145	0082
44	0495	0003	0215	0271	+.0388	+.4491	0785	0012	+.0172	0640
45	1663	0127	+.0964	1237	0277	+.2701	0073	0519	1237	
46	+.0604	+.0457	+.2405	0119	+.0506	0227	+.1180	0052	+,4151	+.0548
47	+.0759	0885	+.0205	+.0973	+.0065	+.4295	0942	+.1786	+.0289	+.0571
48	0084	+.0721	+.0341	0276	0043	0133	0313	1262	5390	+.0241
49	+.0449	+.0033	+.4604	0436	0516	+.0328	0312	+.0112	0290	0016
50			0899							
51	0165	+.2285	0371	+.0156	+.0247	0306	0140	+.0225	+.0235	+.0214
52	0162	+.3015	0006	0052	0359	0330	0697	1414	0447	1487
53			+.0162							
54			+.0967							
55			0113							
56	0970	0459	0235	+.1404	+.0388	4281	1892	+.0636	+.0664	+.0576

<sup>\*</sup> A fold-out key for these factors and variables is presented in Appendix D.



#### APPENDIX E

### Typical Installations



#### APPENDIX F

#### Field Observations



